```
#4. Zadatak
library(readr)
library(dplyr)

##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':
##
## filter, lag
## The following objects are masked from 'package:base':
##
## intersect, setdiff, setequal, union
```

Loading dataset

```
dataset <- read_csv("preprocessed_data.csv")

## Rows: 1460 Columns: 81

## -- Column specification -------

## Delimiter: ","

## chr (43): MSZoning, Street, Alley, LotShape, LandContour, Utilities, LotConf...

## dbl (38): Id, MSSubClass, LotFrontage, LotArea, OverallQual, OverallCond, Ye...

##

## i Use `spec()` to retrieve the full column specification for this data.

## i Specify the column types or set `show_col_types = FALSE` to quiet this message.

not_normal_neighbourhoods <- c("Blmngtn", "Blueste", "BrDale", "ClearCr", "IDOTRR", "MeadowV", "Mitchel" dataset <- subset(dataset, !Neighborhood %in% not_normal_neighbourhoods)</pre>
```

Višestruka regresija

Prije procjene modela višestruke regresije potrebno je provjeriti da pojedini parovi varijabli nisu (previše) korelirani. U principu je određena korelacija između varijabli neizbježna, ali varijable s vrlo visokom korelacijom će uzrokovati probleme u interpretaciji regresijskih rezultata.

Regresija s jako koreliranim ulaznim varijablama će uglavnom dati neke rezultate, ali na temelju njih ne možemo donositi nikakve zaključke. U slučaju savršene linearne zavisnosti ili koreliranosti ulaznih varijabli, procjena regresijskog modela će biti nestabilna i barem jedan koeficijent će biti NA.

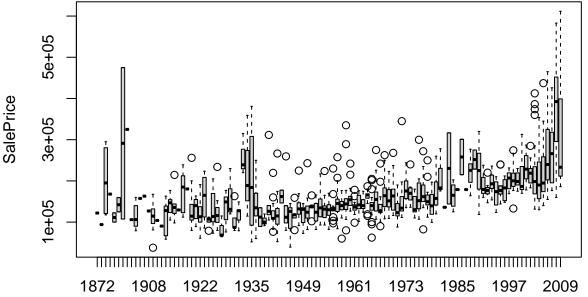
Stoga je potrebo odabrati onaj podskup varijabli za koje smatramo da objašnjavaju različite efekte u podatcima i nisu međusobno (previše) korelirane.

```
neighborhood_factor <- factor(dataset$Neighborhood)
neighborhood_numeric <- as.numeric(neighborhood_factor)
table(neighborhood_numeric)

## neighborhood_numeric
## 1 2 3 4 5 6 7 8 9 10 11
## 58 150 51 100 79 225 77 73 113 74 59
cor(dataset$YearBuilt, dataset$SalePrice)

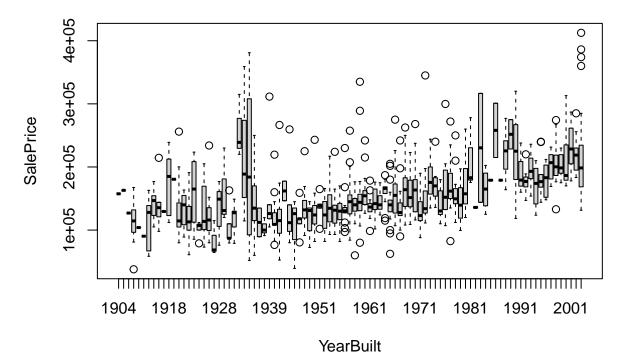
## [1] 0.5163603</pre>
```

```
cor(dataset$GrLivArea, dataset$SalePrice)
## [1] 0.6673089
cor(dataset$OverallQual, dataset$SalePrice)
## [1] 0.795998
cor(neighborhood_numeric, dataset$SalePrice)
## [1] -0.03752398
cor(cbind(dataset$YearBuilt, dataset$GrLivArea, dataset$OverallQual, neighborhood_numeric)) # korelacij
##
                                                          neighborhood numeric
                         1.0000000 0.17717588 0.51859655
##
                                                                   -0.10639943
##
                         0.1771759 1.00000000 0.60403848
                                                                    0.04702938
##
                         0.5185965 0.60403848 1.00000000
                                                                    -0.04900663
## neighborhood_numeric -0.1063994 0.04702938 -0.04900663
                                                                    1.00000000
boxplot(SalePrice ~ YearBuilt , data = dataset) #kvadratni dijagram se moze koristiti za graficki provj
```

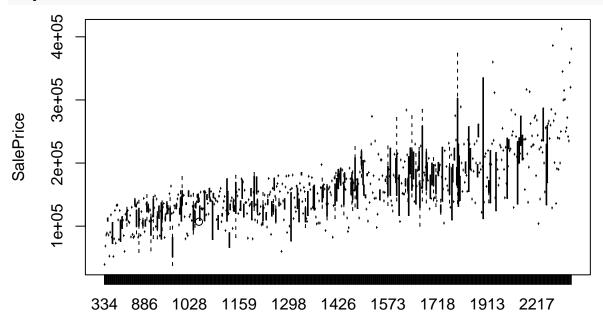


YearBuilt

```
dataset <- dataset %>%
  group_by(YearBuilt) %>%
  filter(YearBuilt < 2004 & YearBuilt > 1900)
boxplot(SalePrice ~ YearBuilt , data = dataset)
```

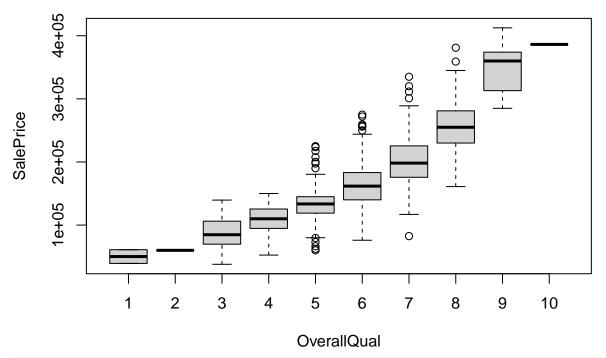


boxplot(SalePrice ~ GrLivArea , data = dataset)

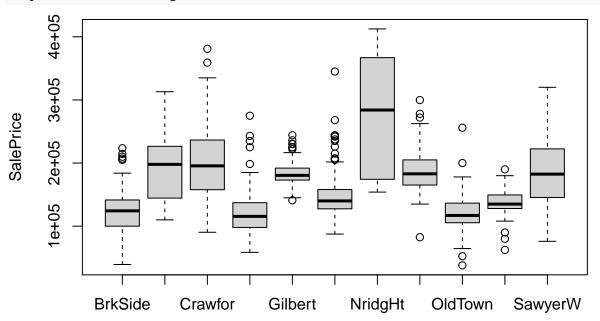


GrLivArea

boxplot(SalePrice ~ OverallQual , data = dataset)



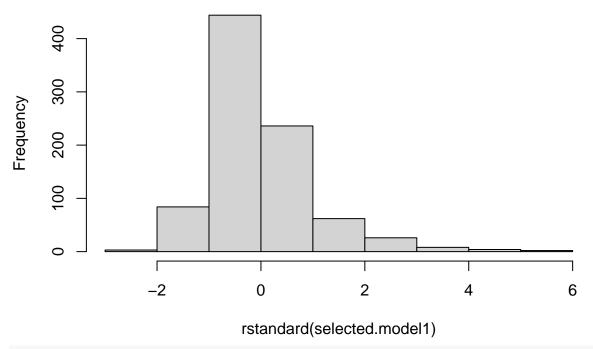
boxplot(SalePrice ~ Neighborhood , data = dataset)



Neighborhood

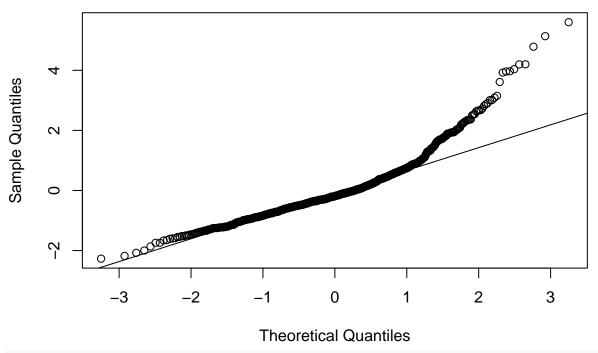
```
fit.YearBuilt = lm(SalePrice ~ YearBuilt , data=dataset)
fit.GrLivArea = lm(SalePrice ~ GrLivArea , data=dataset)
fit.OverallQual = lm(SalePrice ~ OverallQual , data=dataset)
fit.Neighborhood = lm(SalePrice ~ Neighborhood , data=dataset)
selected.model1 = fit.YearBuilt
hist(rstandard(selected.model1))
```

Histogram of rstandard(selected.model1)



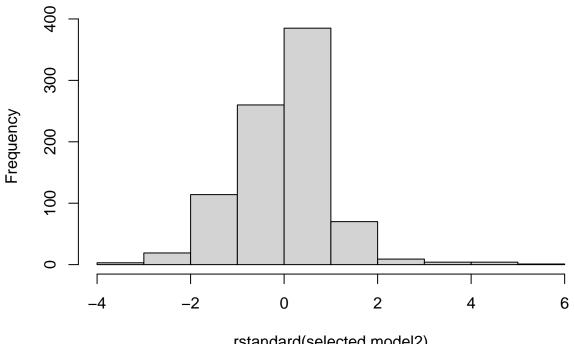
qqnorm(rstandard(selected.model1))
qqline(rstandard(selected.model1))

Normal Q-Q Plot



selected.model2 = fit.GrLivArea
hist(rstandard(selected.model2))

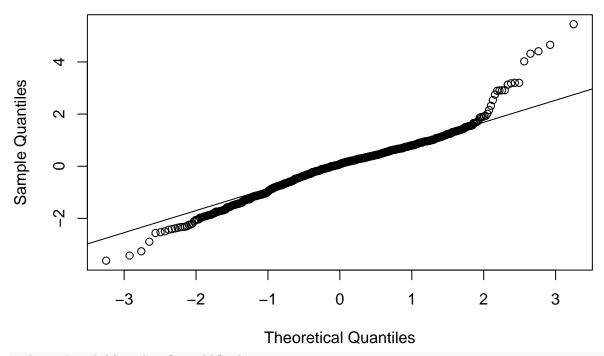
Histogram of rstandard(selected.model2)



rstandard(selected.model2)

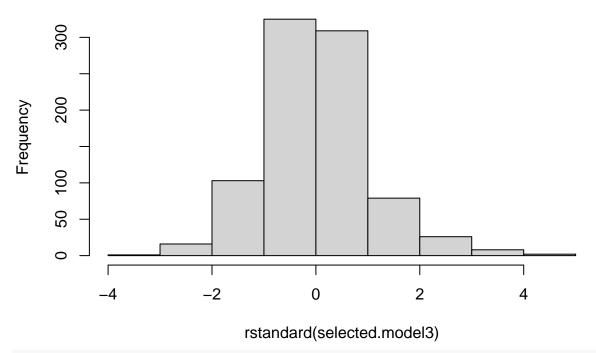
qqnorm(rstandard(selected.model2)) qqline(rstandard(selected.model2))

Normal Q-Q Plot



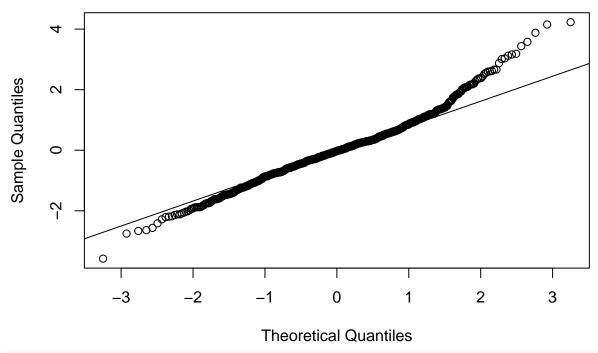
selected.model3 = fit.OverallQual hist(rstandard(selected.model3))

Histogram of rstandard(selected.model3)



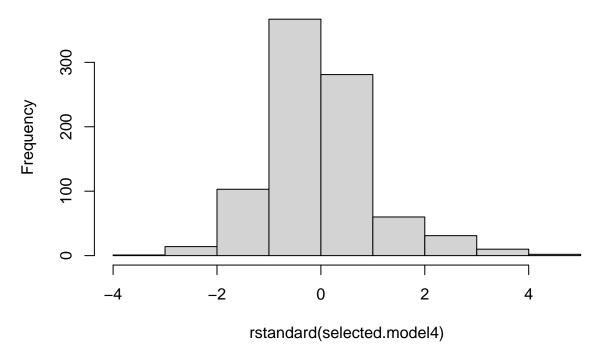
qqnorm(rstandard(selected.model3))
qqline(rstandard(selected.model3))

Normal Q-Q Plot



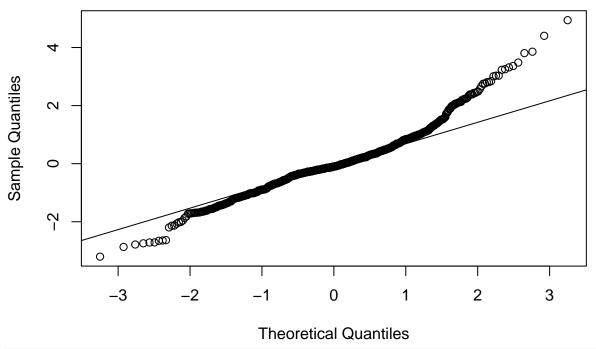
selected.model4 = fit.Neighborhood
hist(rstandard(selected.model4))

Histogram of rstandard(selected.model4)



qqnorm(rstandard(selected.model4))
qqline(rstandard(selected.model4))

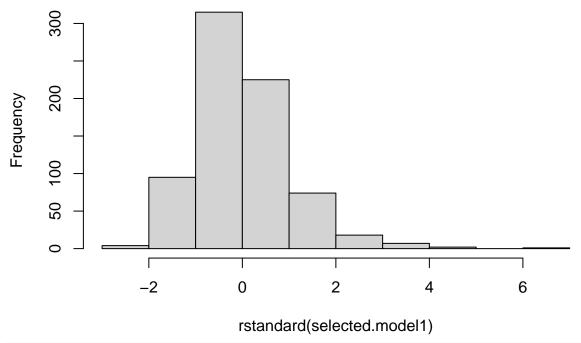
Normal Q-Q Plot



dataset <- dataset %>%
 group_by(YearBuilt) %>%

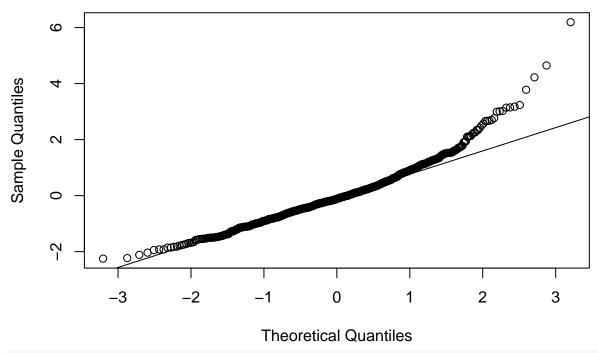
```
mutate(Q1 = quantile(SalePrice, .25),
         Q3 = quantile(SalePrice, .75),
         IQR = IQR(SalePrice),
         lower bound = Q1 - 1.5*IQR,
         upper_bound = Q3 + 1.5*IQR) %>%
  filter(SalePrice > lower_bound & SalePrice < upper_bound)</pre>
dataset <- dataset %>%
  group_by(Neighborhood) %>%
  mutate(Q1 = quantile(SalePrice, .25),
         Q3 = quantile(SalePrice, .75),
         IQR = IQR(SalePrice),
         lower_bound = Q1 - 1.5*IQR,
         upper_bound = Q3 + 1.5*IQR) %>%
  filter(SalePrice > lower_bound & SalePrice < upper_bound)</pre>
dataset <- dataset %>%
  group_by(OverallQual) %>%
  mutate(Q1 = quantile(SalePrice, .25),
         Q3 = quantile(SalePrice, .75),
         IQR = IQR(SalePrice),
         lower_bound = Q1 - 1.5*IQR,
         upper bound = Q3 + 1.5*IQR) \%
 filter(SalePrice > lower_bound & SalePrice < upper_bound)</pre>
 #Drugi nacin
# datas <- split(dataset, dataset$Neighborhood)</pre>
# data_no_outlier <- NULL</pre>
# for (i in 1:14){
  Q1 <- quantile(datas[[i]]$SalePrice, .25)
# Q3 <- quantile(datas[[i]]$SalePrice, .75)
  IQR <- IQR(datas[[i]]$SalePrice)</pre>
# Lowers <- Q1 - 1.5*IQR
# Uppers <- Q3 + 1.5*IQR
  out <- subset(datas[[i]], datas[[i]]$SalePrice > Lowers & datas[[i]]$SalePrice < Uppers)
   data_no_outlier <- rbind(data_no_outlier, out)</pre>
# }
# dataset <- data_no_outlier</pre>
# boxplot(SalePrice ~ Neighborhood, data = dataset)
fit.YearBuilt = lm(SalePrice ~ YearBuilt , data=dataset)
fit.GrLivArea = lm(SalePrice ~ GrLivArea , data=dataset)
fit.OverallQual = lm(SalePrice ~ OverallQual , data=dataset)
fit.Neighborhood = lm(SalePrice ~ Neighborhood , data=dataset)
selected.model1 = fit.YearBuilt
hist(rstandard(selected.model1))
```

Histogram of rstandard(selected.model1)



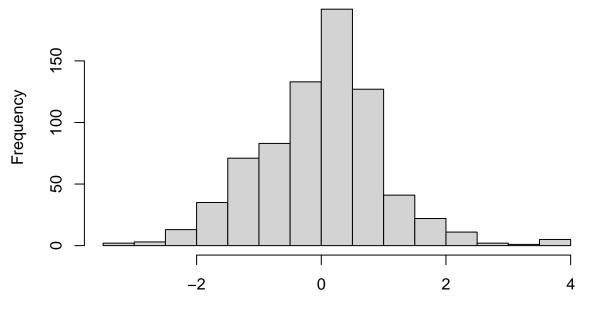
qqnorm(rstandard(selected.model1))
qqline(rstandard(selected.model1))

Normal Q-Q Plot



selected.model2 = fit.GrLivArea
hist(rstandard(selected.model2))

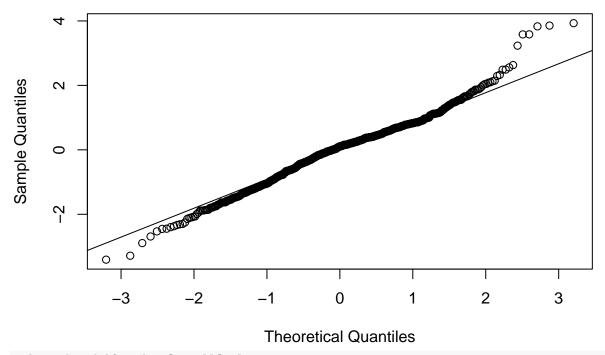
Histogram of rstandard(selected.model2)



rstandard(selected.model2)

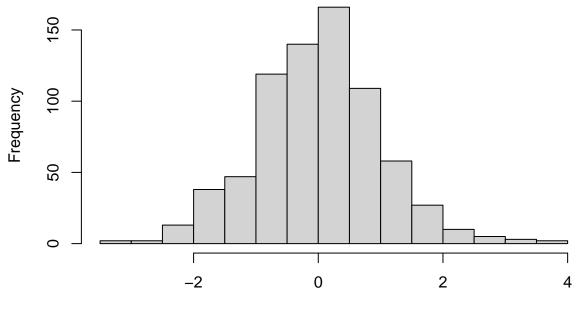
qqnorm(rstandard(selected.model2))
qqline(rstandard(selected.model2))

Normal Q-Q Plot



selected.model3 = fit.OverallQual
hist(rstandard(selected.model3))

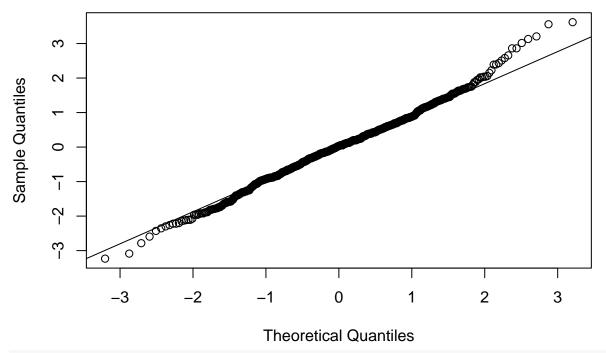
Histogram of rstandard(selected.model3)



rstandard(selected.model3)

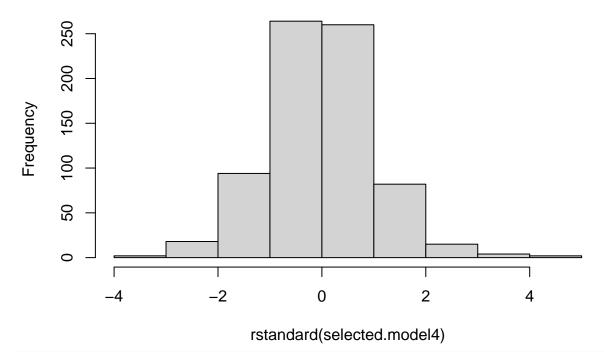
qqnorm(rstandard(selected.model3))
qqline(rstandard(selected.model3))

Normal Q-Q Plot



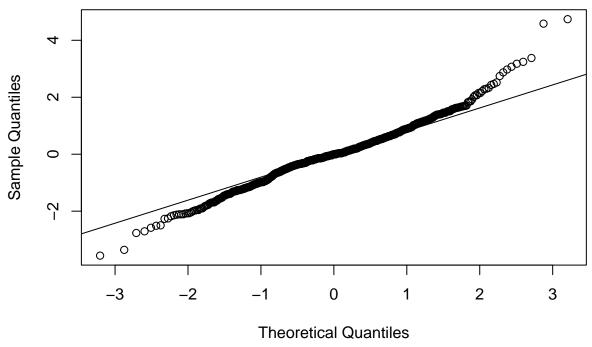
selected.model4 = fit.Neighborhood
hist(rstandard(selected.model4))

Histogram of rstandard(selected.model4)



qqnorm(rstandard(selected.model4))
qqline(rstandard(selected.model4))

Normal Q-Q Plot



#require(fastDummies)
#dataset <- dummy_cols(dataset,select_columns='OverallQual')</pre>

```
#dataset <- dummy_cols(dataset,select_columns='Neighborhood')</pre>
#procjena modela s dummy varijablama
fit.multi.d = lm(SalePrice ~ YearBuilt +GrLivArea + OverallQual + Neighborhood, dataset)
summary(fit.multi.d)
##
## Call:
## lm(formula = SalePrice ~ YearBuilt + GrLivArea + OverallQual +
##
      Neighborhood, data = dataset)
##
## Residuals:
##
     Min
             1Q Median
                           3Q
                                 Max
## -74367 -10348
                 1076 10538
                               91413
##
## Coefficients:
##
                        Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                      -1.105e+06 1.095e+05 -10.088 < 2e-16 ***
## YearBuilt
                       5.756e+02 5.706e+01 10.088 < 2e-16 ***
## GrLivArea
                       3.964e+01 2.207e+00 17.962 < 2e-16 ***
                       1.281e+04 9.277e+02 13.809
## OverallQual
                                                     < 2e-16 ***
## NeighborhoodCollgCr 5.956e+03 4.860e+03
                                             1.225
                                                      0.2208
## NeighborhoodCrawfor 2.457e+04 4.598e+03
                                              5.345 1.21e-07 ***
## NeighborhoodEdwards -7.768e+03 3.735e+03 -2.080
                                                      0.0379 *
## NeighborhoodGilbert -1.015e+04 5.339e+03 -1.901
                                                      0.0577
## NeighborhoodNAmes
                      -4.521e+02 3.473e+03 -0.130
                                                      0.8965
## NeighborhoodNridgHt 6.615e+03 8.638e+03
                                             0.766
                                                      0.4441
## NeighborhoodNWAmes
                                             0.782
                                                      0.4347
                       3.511e+03 4.492e+03
## NeighborhoodOldTown -4.346e+03 3.539e+03 -1.228
                                                      0.2198
## NeighborhoodSawyer
                       3.719e+02 4.075e+03
                                              0.091
                                                      0.9273
## NeighborhoodSawyerW 1.576e+03 4.966e+03
                                              0.317
                                                      0.7511
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 18650 on 727 degrees of freedom
## Multiple R-squared: 0.7858, Adjusted R-squared: 0.7819
## F-statistic: 205.1 on 13 and 727 DF, p-value: < 2.2e-16
```